

MRB-CMC internal seminars

28 Jan. 2005 11h00

Atmospheric CO₂ retrieval from the AIRS and AMSU instruments onboard AQUA



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PRESENTATION OUTLINE

- Why is it interesting to measure CO₂ from space ?
- Which instruments are available for this purpose ?
- Presentation of the AIRS and AMSU instruments
- Radiative transfer, principles of atmospheric sounding
- Description of the retrieval method
- First results
- Conclusion, perspectives

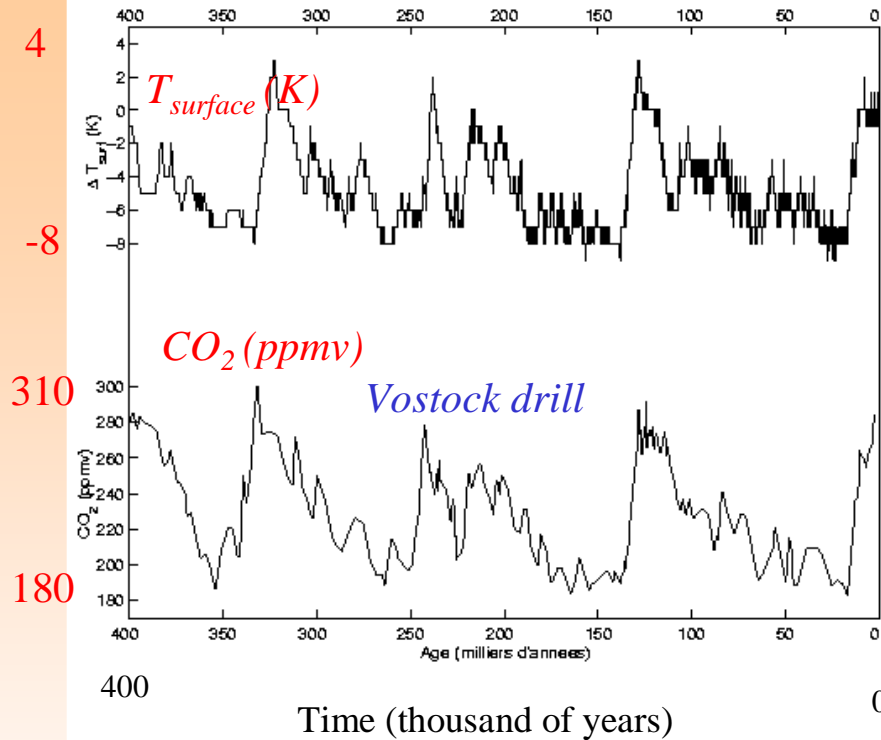
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Introduction

Motivation of the study

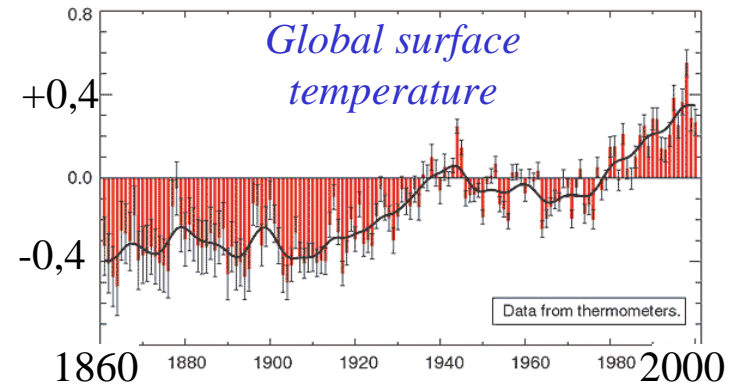
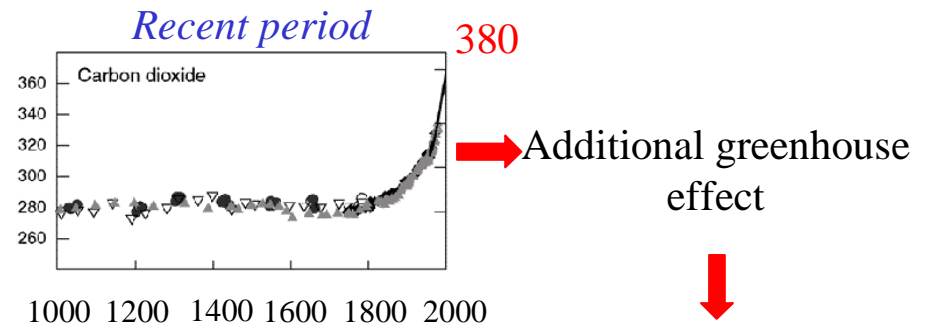
CO₂ is one of the main greenhouse gases.



The increase of atmospheric CO₂ concentration is responsible for 50% of the additional greenhouse effect.

It is essential to model the future evolution of CO₂.

Human activities are responsible for additional CO₂ emissions.



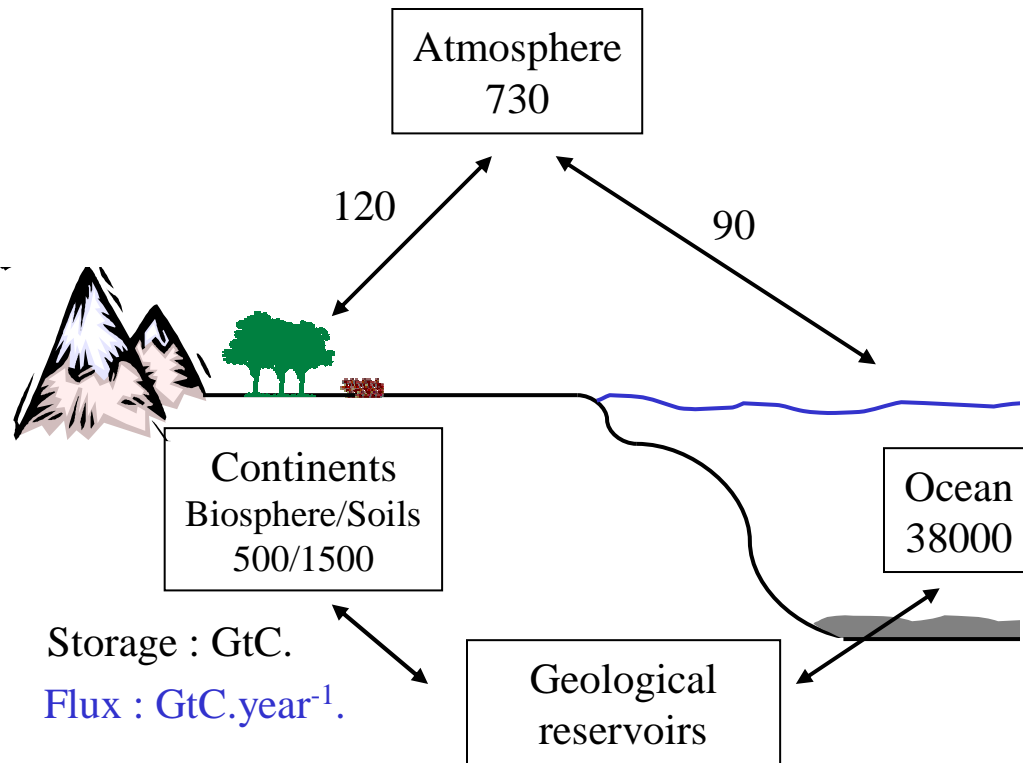
Necessity of understanding the processes which governs its evolution.



Introduction

Motivation of the study

CO₂ is cyclically exchanged between several reservoirs.

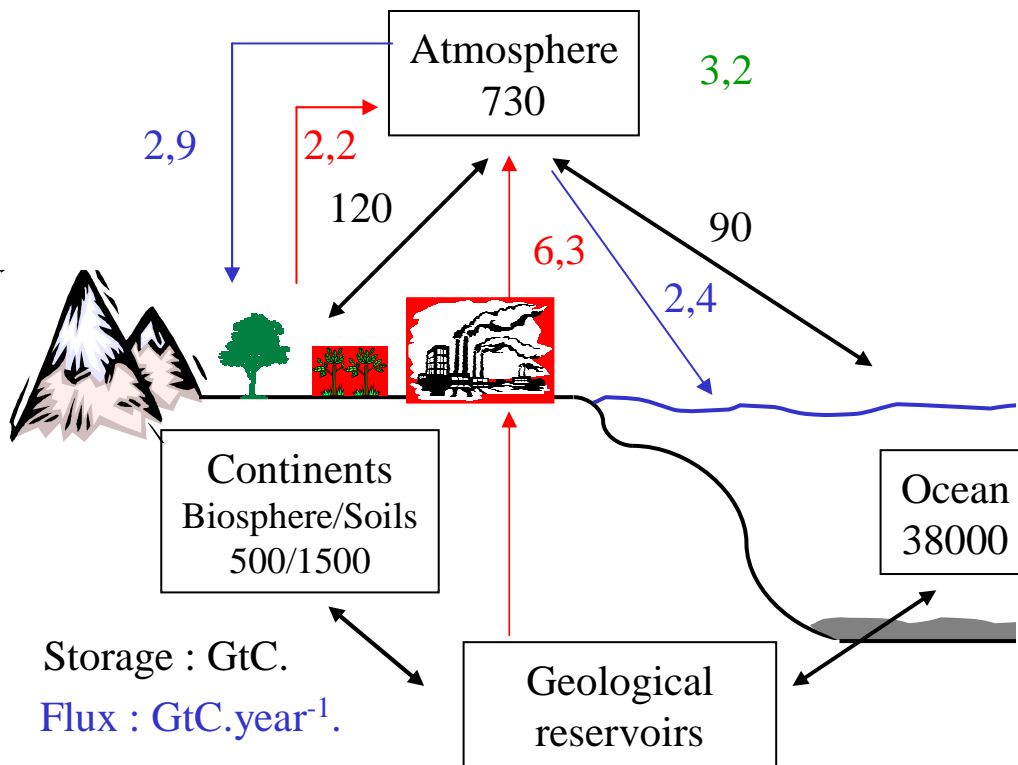


Introduction

Carbon cycle

CO₂ is cyclically exchanged between several reservoirs.

Human activities perturb the natural carbon cycle.

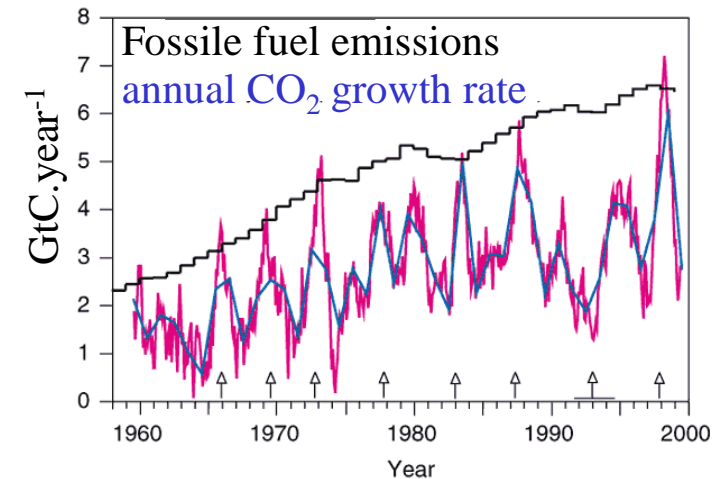


Anthropic CO₂ sources :

- **fossile fuels combustion**
- agricultural changes
- cement production

Surface sinks:

- ocean
- continents (?)



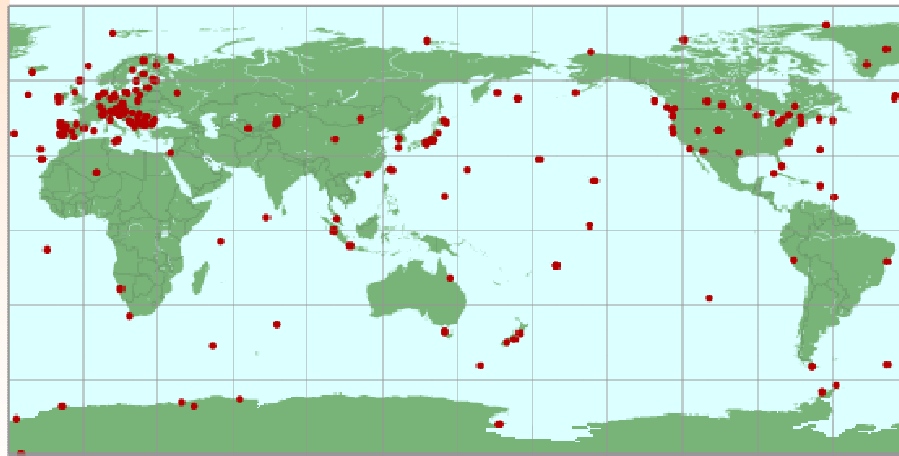
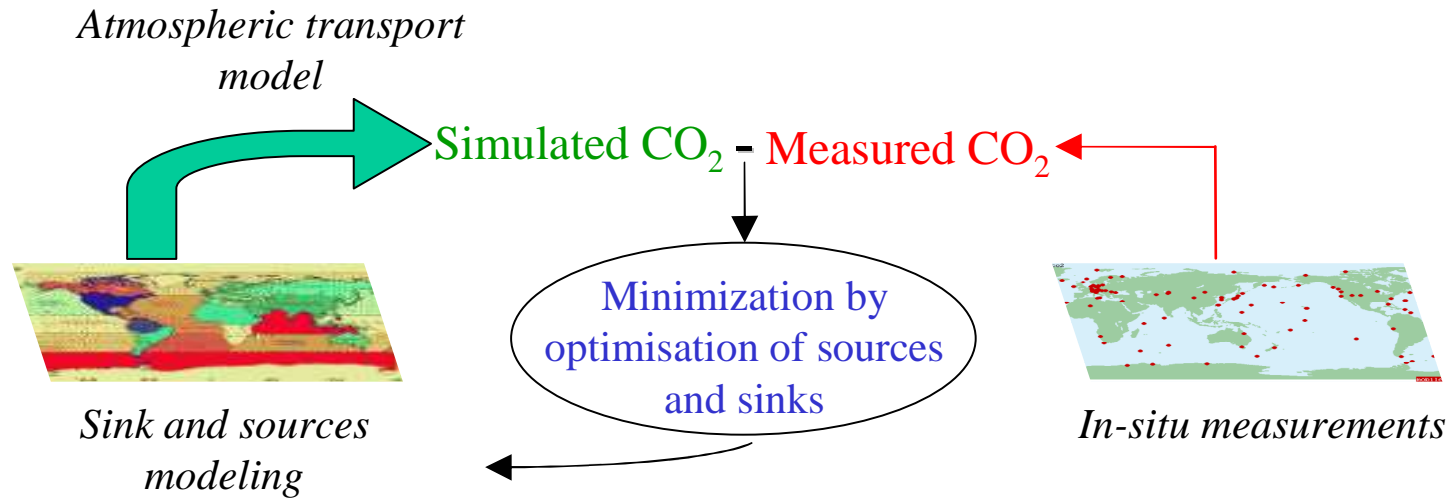
In order to model the future evolution of atmospheric CO₂, it is essential to understand **CO₂ sources and sinks**.



Introduction

Motivation of the study

Top down approach :



Map of the WDCGG surface observation network

Uneven and partial spatial coverage

Space observations, which are global and continuous, should help to constrain the problem

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Introduction

CO₂ from space

Many instruments become available to study CO₂ from space.

Flying

TOVS (HIRS+MSU)	Vertical sounder	thermal IR+ MW	1978
AIRS + AMSU	Vertical sounder	thermal IR + MW	2002
SCIAMACHY	Differential absorption	NIR	2002

Scheduled

IASI + AMSU	Vertical sounder	thermal IR + MW	2005
OCO	Differential absorption	NIR	2007

Under study

Active methods

Many instruments become available to study CO₂ from space.

Flying

TOVS (HIRS+MSU)	Vertical sounder	thermal IR+ MW	1978
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Scheduled

IASI + AMSU	Vertical sounder	thermal IR + MW	2005
OCO	Differential absorption	NIR	2007

Under study

Active methods

The feasibility of measuring CO₂ from space has been proven with the low spectral resolution instruments TOVS flying onboard the NOAA polar satellites since 1978 [Chédin *et al.* 1999, 2002, 2003].

Four years of observations (Juillet 1987-Juin 1991) of tropospheric CO₂ have been retrieved in the tropics, with an estimated precision of 3 ppmv and a spatial resolution of 15°×15°.

à Extension to the second generation AIRS instrument.



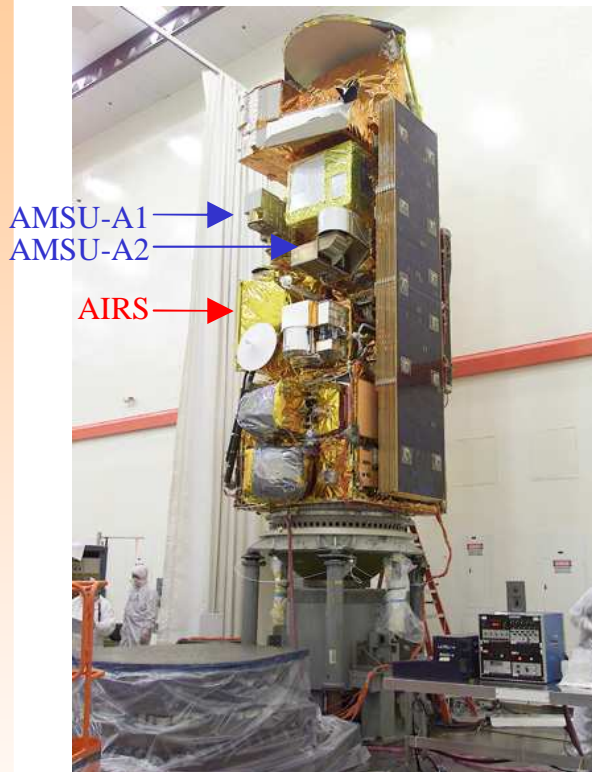
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Observation from space

The Aqua satellite

In this study, we use two vertical sounders flying onboard the Aqua spacecraft.



. Polar satellite afternoon (13H30).

. Date of launch: 4 May 2002.

. First component of A-train constellation.

. Six instruments dedicated to the atmosphere :
AMSR-E MODIS CERES AIRS AMSU HSB



Atmospheric Infrared Sounder

2378 IR channels

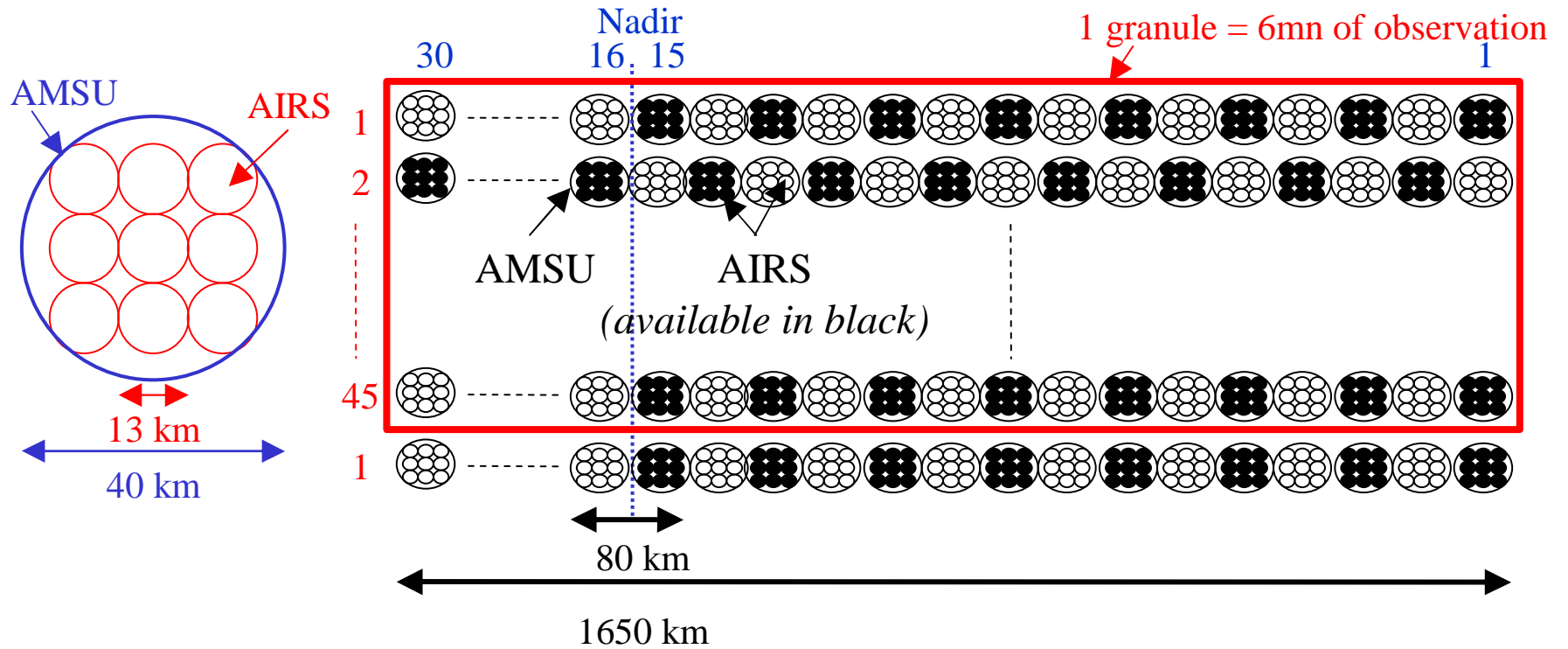
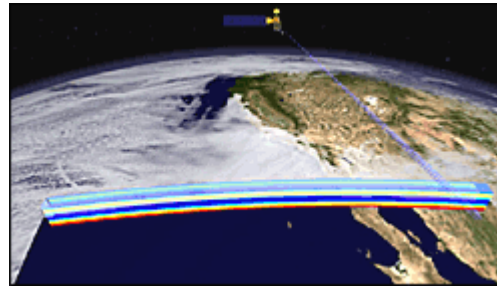
Advanced Microwave Sounding Unit

15 MW channels

LMD stores AIRS/AMSU data since April 2003 with the highest spatial resolution available.

Observation from space

The AIRS archive at LMD



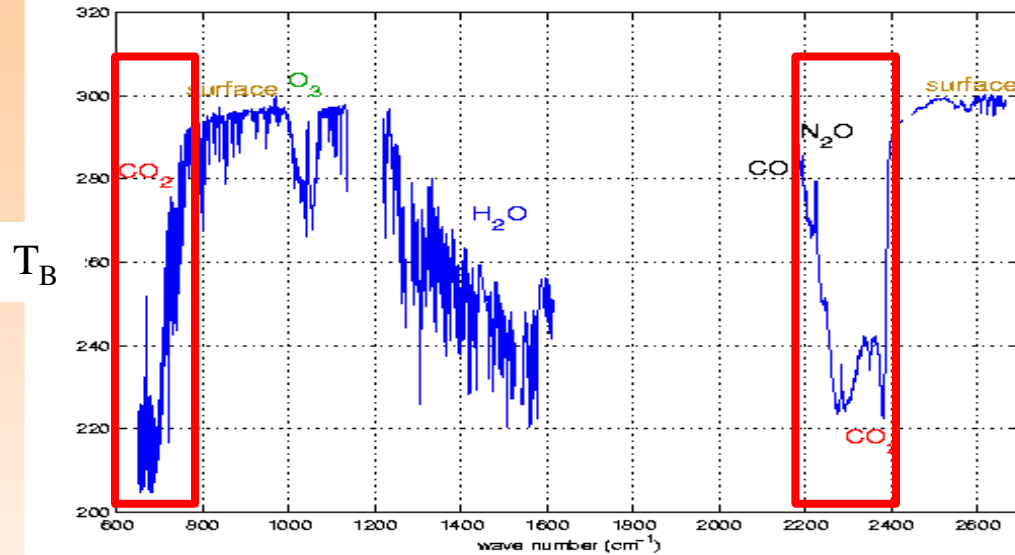
AIRS data are distributed on a daily basis by NOAA/NESDIS.

April-October 2003 (night)

Since end of December 2003 (day and night)



7 months of observations sharing common characteristics



15 μm

4.3 μm

AIRS **Spectral** characteristics :

- . 2378 channels (324 distributed).
- . three IR bands (from 650 to 2800 cm^{-1}).
- . Spectral resolution: $\lambda/\Delta\lambda=1200$

AMSU-A **Spectral** characteristics :

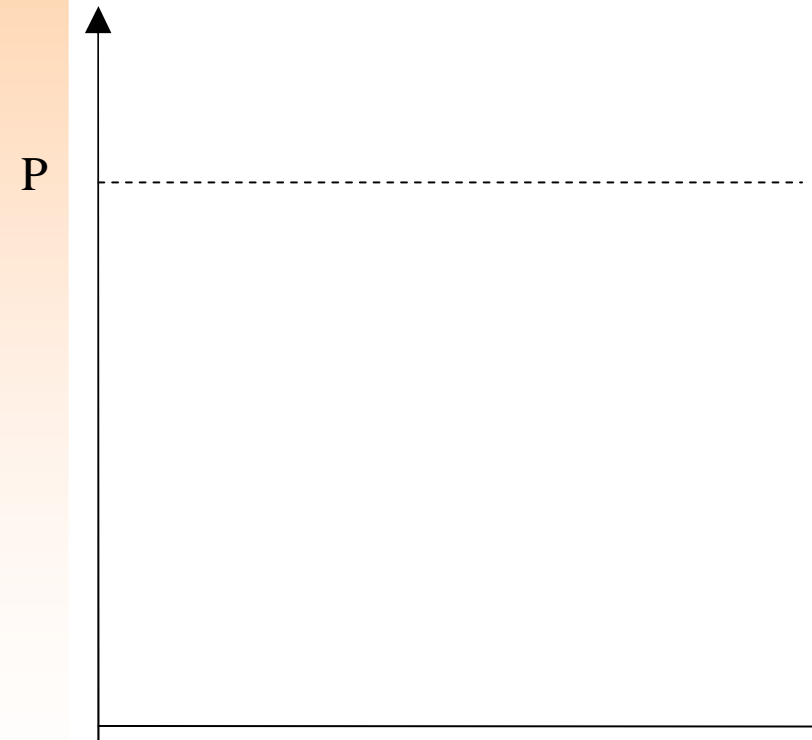
- . 15 channels between 15 and 90 GHz.
- . Instrumental noise: 0,25 K for the 55 GHz channels

Instrumental noise: 0,2-0,3 K at 250 K.

PRESENTATION OUTLINE

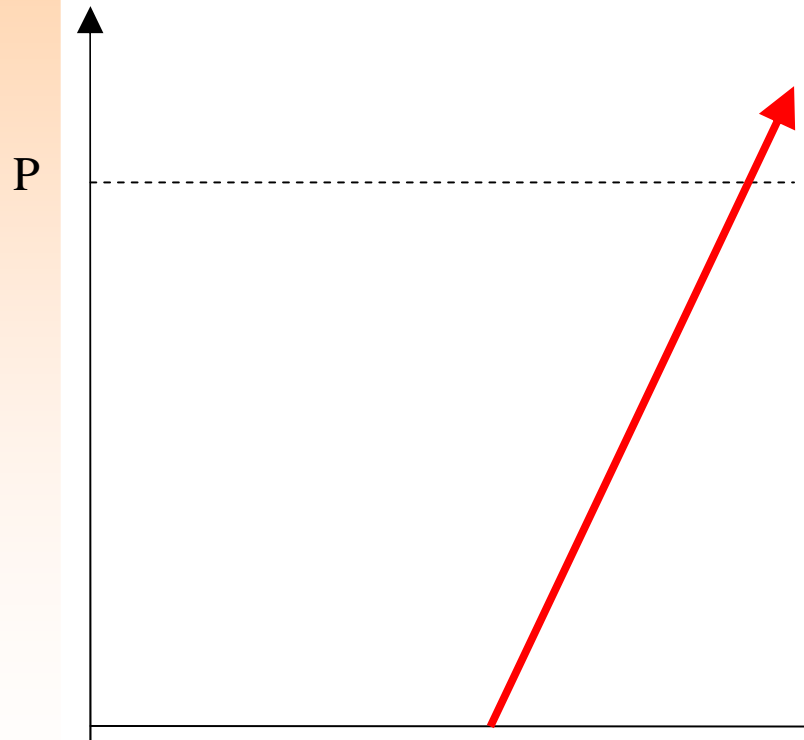
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Vertical sounders measure the radiation (in terms of **brightness temperature**) emitted by the system Earth/atmosphere at different frequencies with a near-nadir viewing angle



$$I(\nu) =$$

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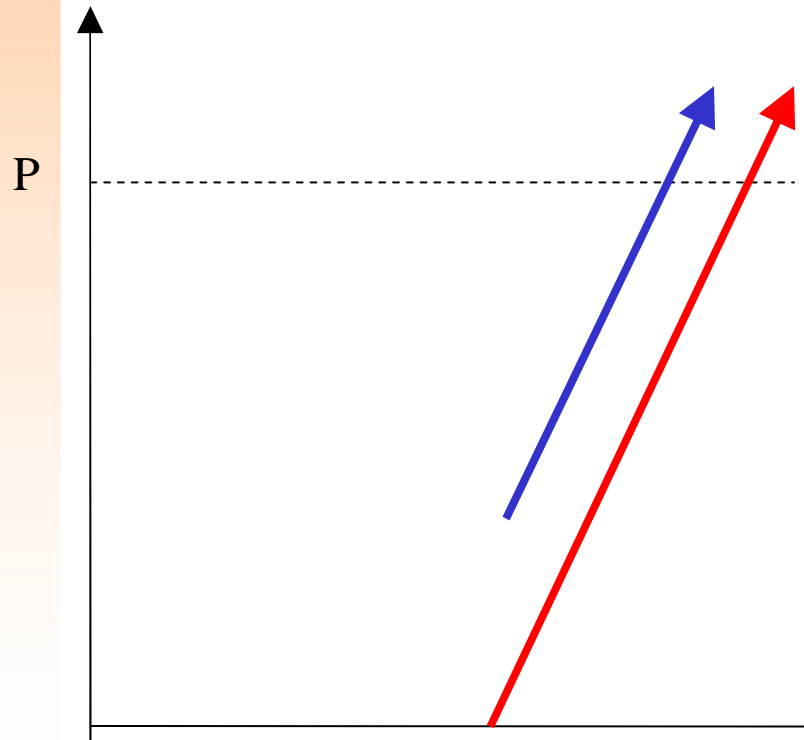


$$I(\nu) = \epsilon_s \tau_s B(\nu, T_s)$$

Observation from space

Basic radiative transfer theory

Vertical sounders measure the radiation (in terms of **brightness temperature**) emitted by the system Earth/atmosphere at different frequencies with a near-nadir viewing angle



$$I(\nu) = \epsilon_s \tau_s B(\nu, T_s)$$

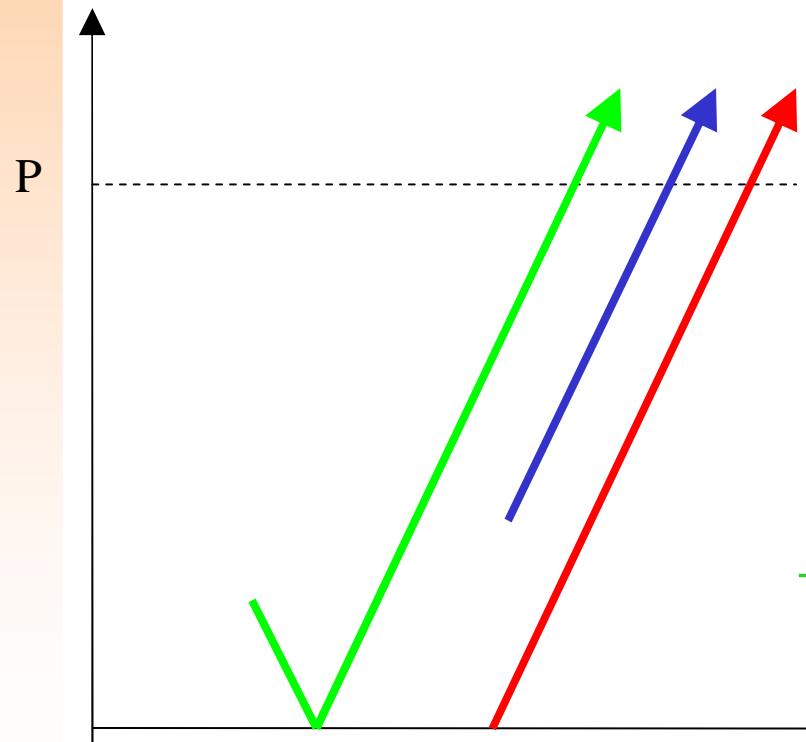
$$+ \int_{\ln P_s}^{-\infty} B_\nu[\nu, T(\ln P)] \frac{\partial \tau(\nu)}{\partial \ln P} d \ln P$$

Observation from space

Basic radiative transfer theory

Vertical sounders measure the radiation (in terms of **brightness temperature**) emitted by the system Earth/atmosphere at different frequencies with a near-nadir viewing angle

(equations valid for a plane parallel atmosphere, scattering free, local thermodynamical equilibrium)



$$I(\nu) = \epsilon_s \tau_s B(\nu, T_s)$$

$$+ \int_{\ln P_s}^{-\infty} B_\nu[\nu, T(\ln P)] \frac{\partial \tau(\nu)}{\partial \ln P} d \ln P$$

$$+ (1 - \epsilon_s) \tau_s \int_{-\infty}^{\ln P_s} B[\nu, T(\ln P)] \frac{\partial \tau'(\nu)}{\partial \ln P} d \ln P$$

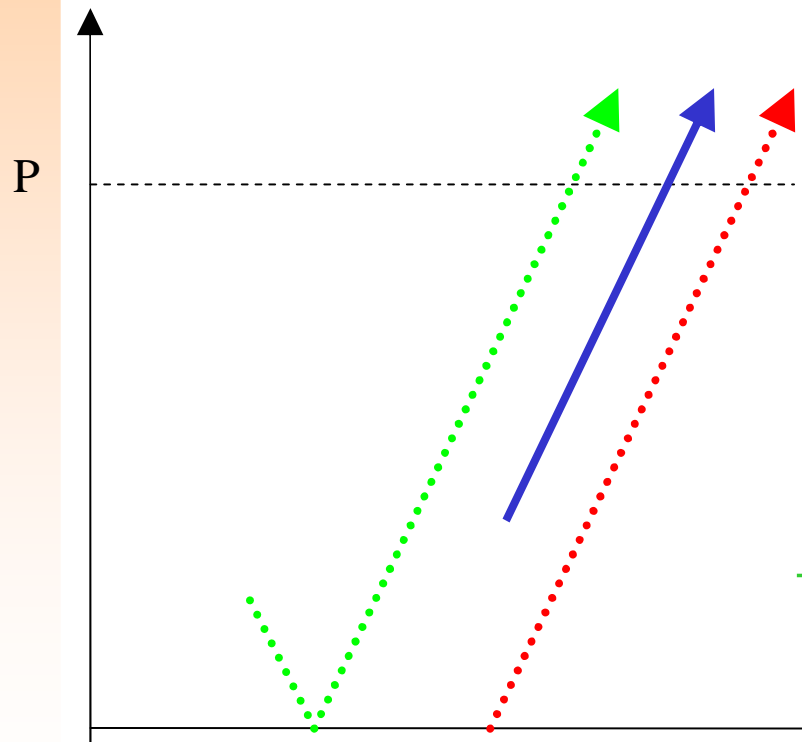
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Basic radiative transfer theory

Vertical sounders measure the radiation (in terms of **brightness temperature**) emitted by the system Earth/atmosphere at different frequencies with a near-nadir viewing angle

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Restriction to channels who don't see the surface



$$I(\nu) = \cancel{\varepsilon_s \tau_s B(\nu, T_s)}$$

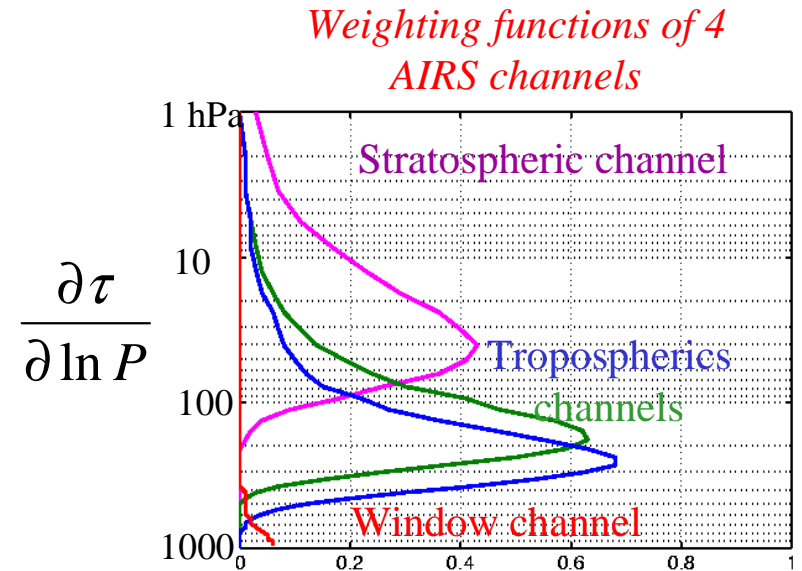
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Observation from space

Basic radiative transfer theory

$$I(\nu) = \int_{\ln P_s}^{-\infty} \underbrace{B_\nu[\nu, T(\ln P)]}_{\text{Temperature}} \underbrace{\left(\frac{\partial \tau(\nu)}{\partial \ln P} \right)}_{\text{Atmospheric composition}} d \ln P$$



If ν is chosen in the absorption band of a well mixed gas of known mixing-ratio, it can provide information on the temperature profile.

Infrared instruments CO₂ absorption bands

Microwave instruments O₂ absorption bands

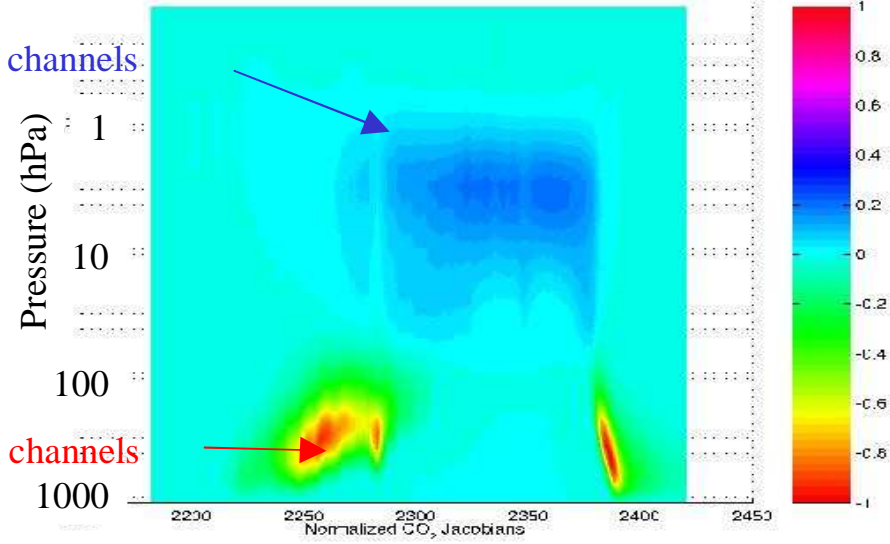
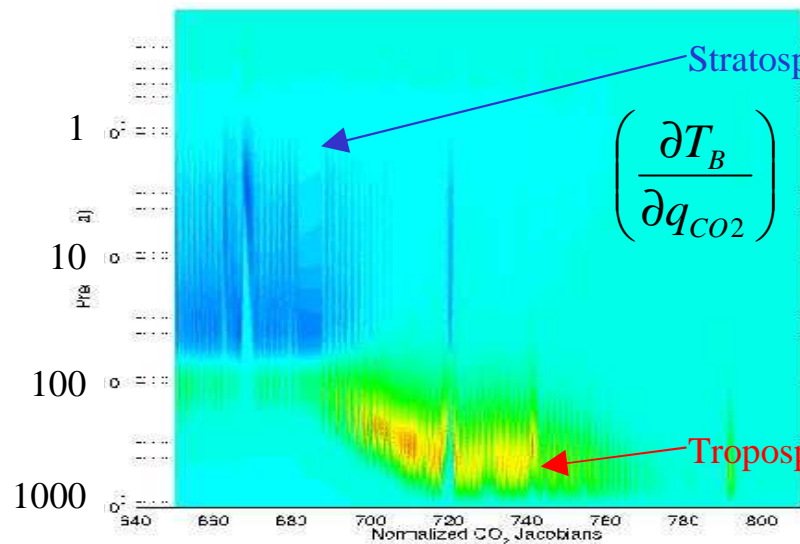
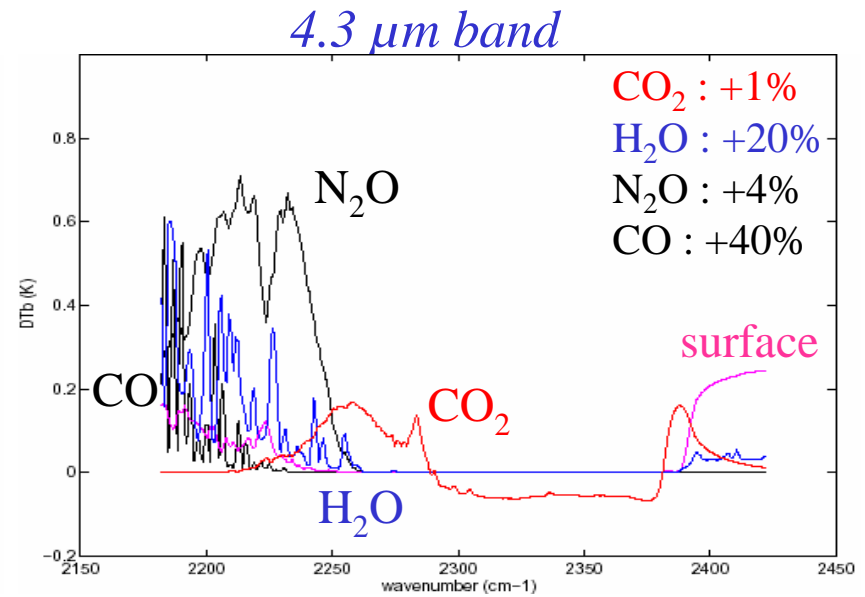
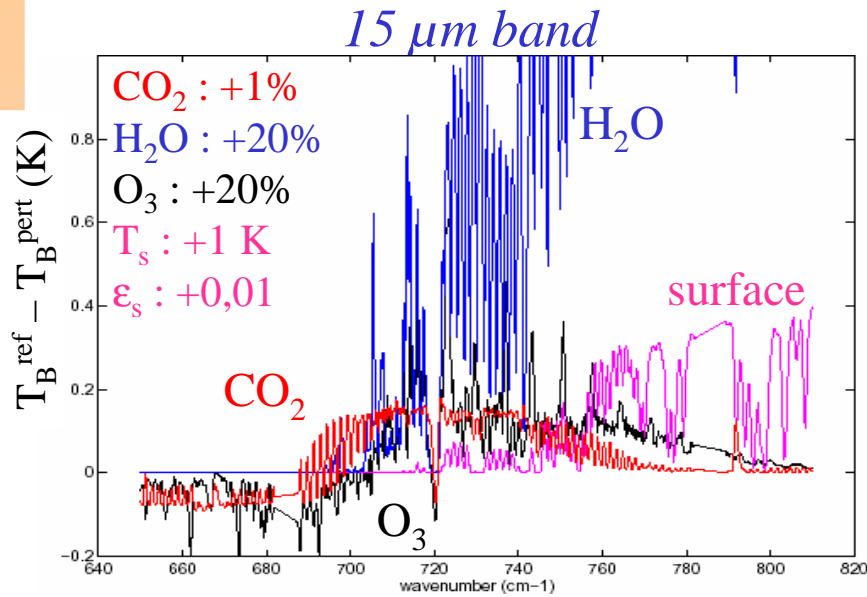
{ IR : sensitives to T et CO₂
 { MW : sensitives to T
 ➡ decorrelation T/CO₂.

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Method

AIRS and CO₂

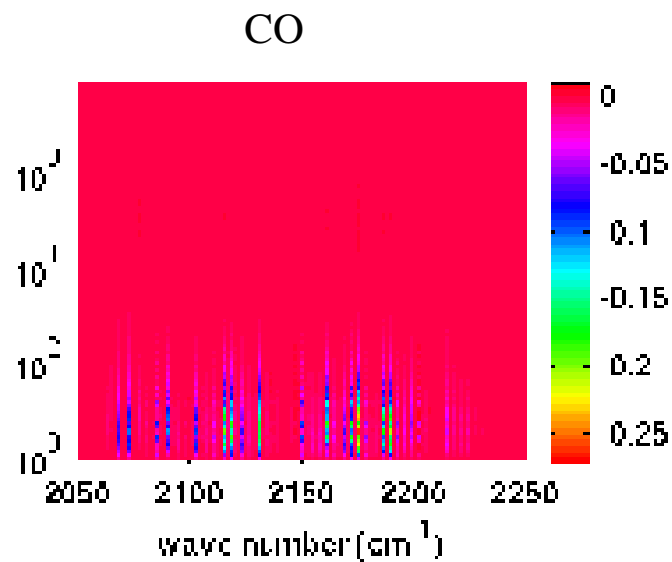
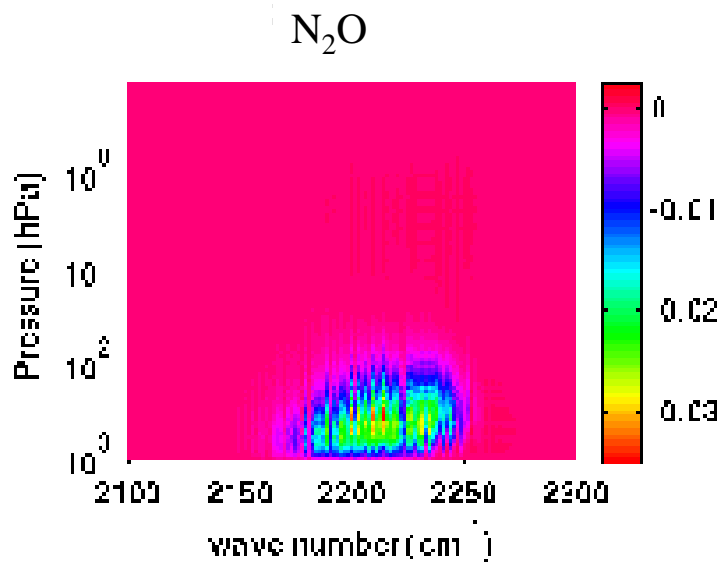
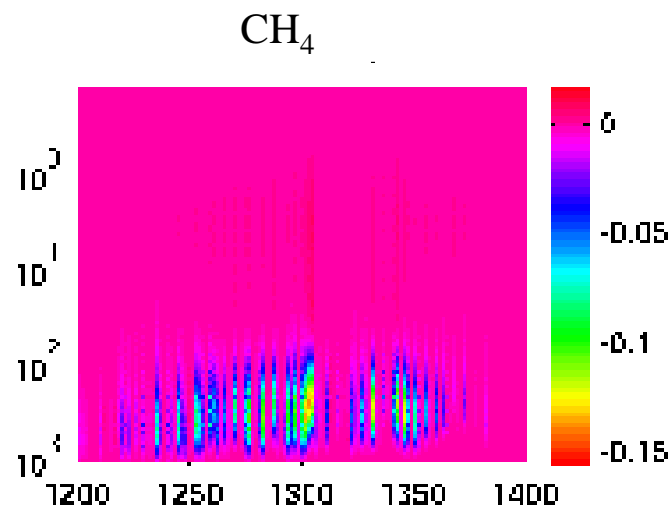
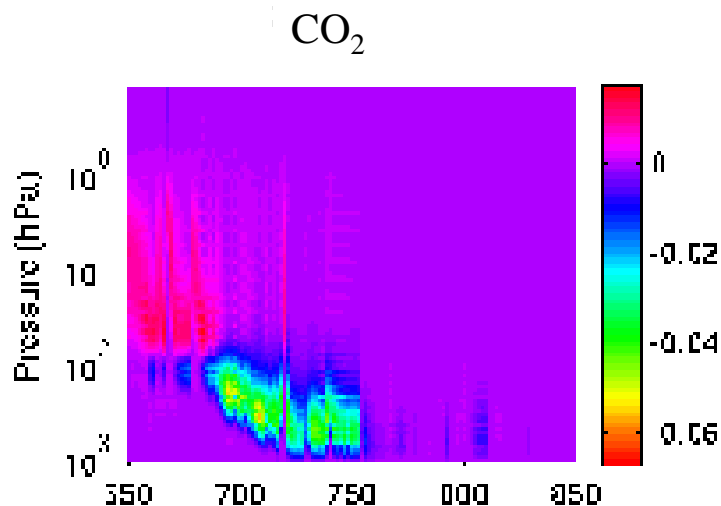


No sensitivity to CO₂ variations in the tropopause/boundary layer.

Method

AIRS and other trace gases

- AIRS may be used to retrieve other trace gases.



Method

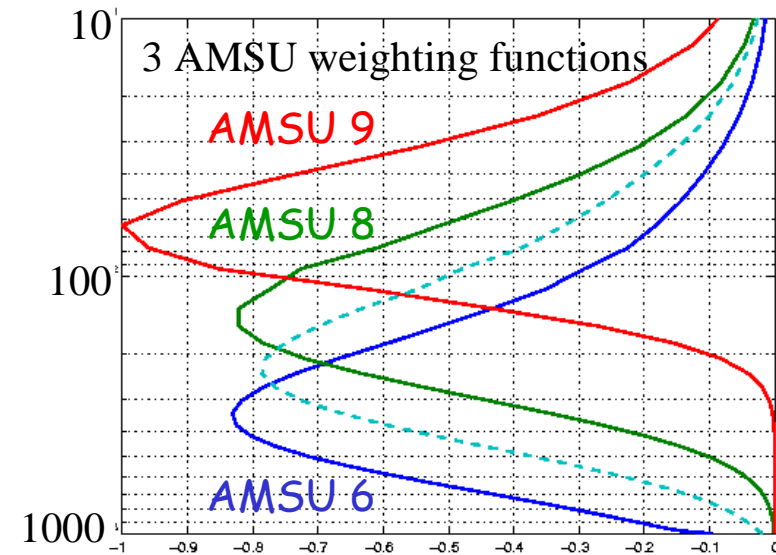
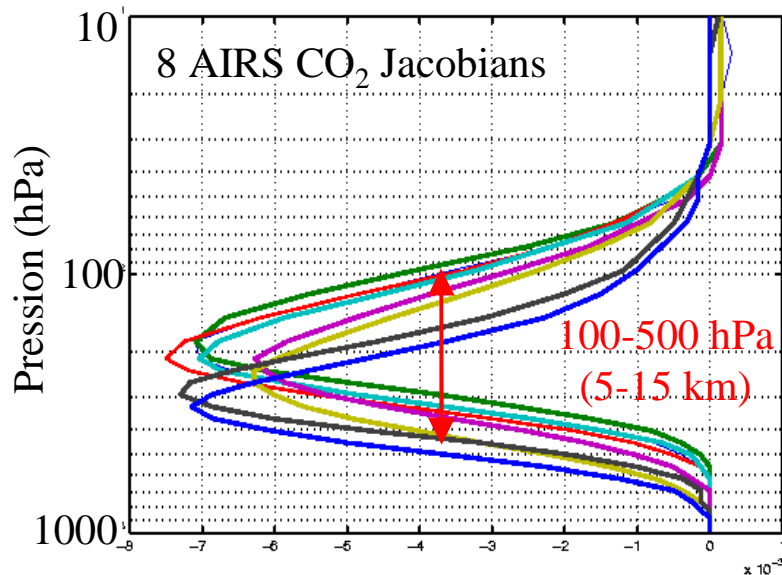
AIRS and CO₂

AIRS channels are selected using the OSP (**Optimum Sensitivity Profile**) method which is based on 3 criteria:

- CO₂ signal must be maximum.
- interferences must have the lowest influence.
- altitude of the sounding.

➔ 8 AIRS channels for CO₂ + 16 channels for CH₄, N₂O and CO.

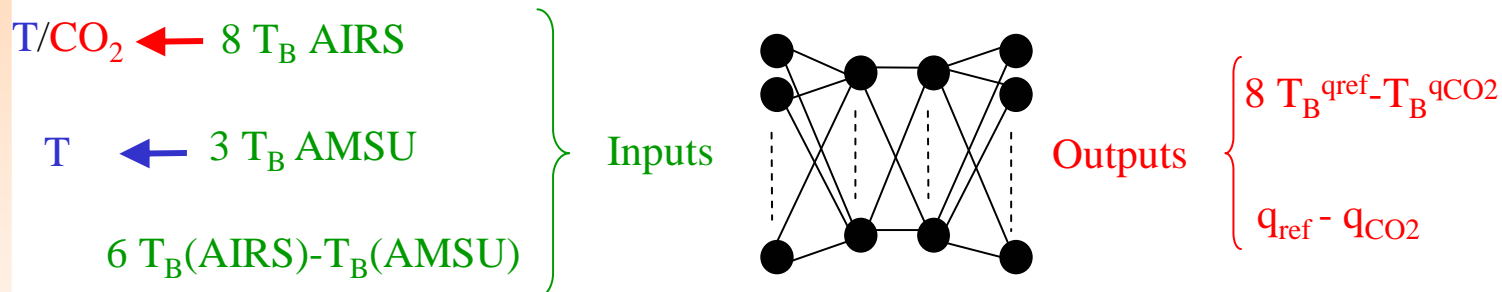
These channels have been chosen to be distributed by NOAA/NESDIS.



Study of CO₂ in the mid-upper troposphere.

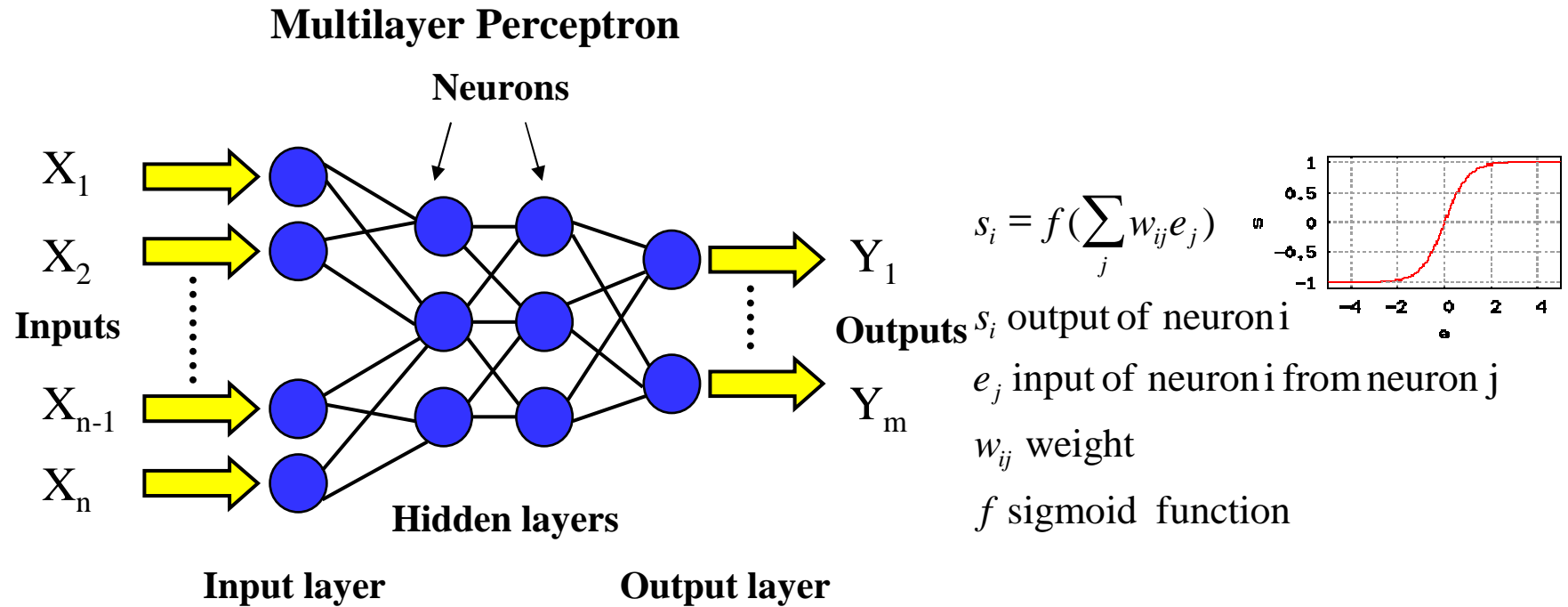
- . A change of **1% of the CO₂** concentration induces a change of **0.04% of the signal** observed on the channels.
- . The signal is of the same level as instrumental **noise**.
- . **Non-linearities** makes it difficult to solve this inverse problem.

→ Use is made of a **non-linear inference scheme** based on neural networks.



- . The retrieval is limited to the **tropical zone**:
 - greater tropospheric temperature stability.
 - stronger convective vertical mixing from surface to mid-troposphere.
 - need of observations in this part of the globe.

Neural network

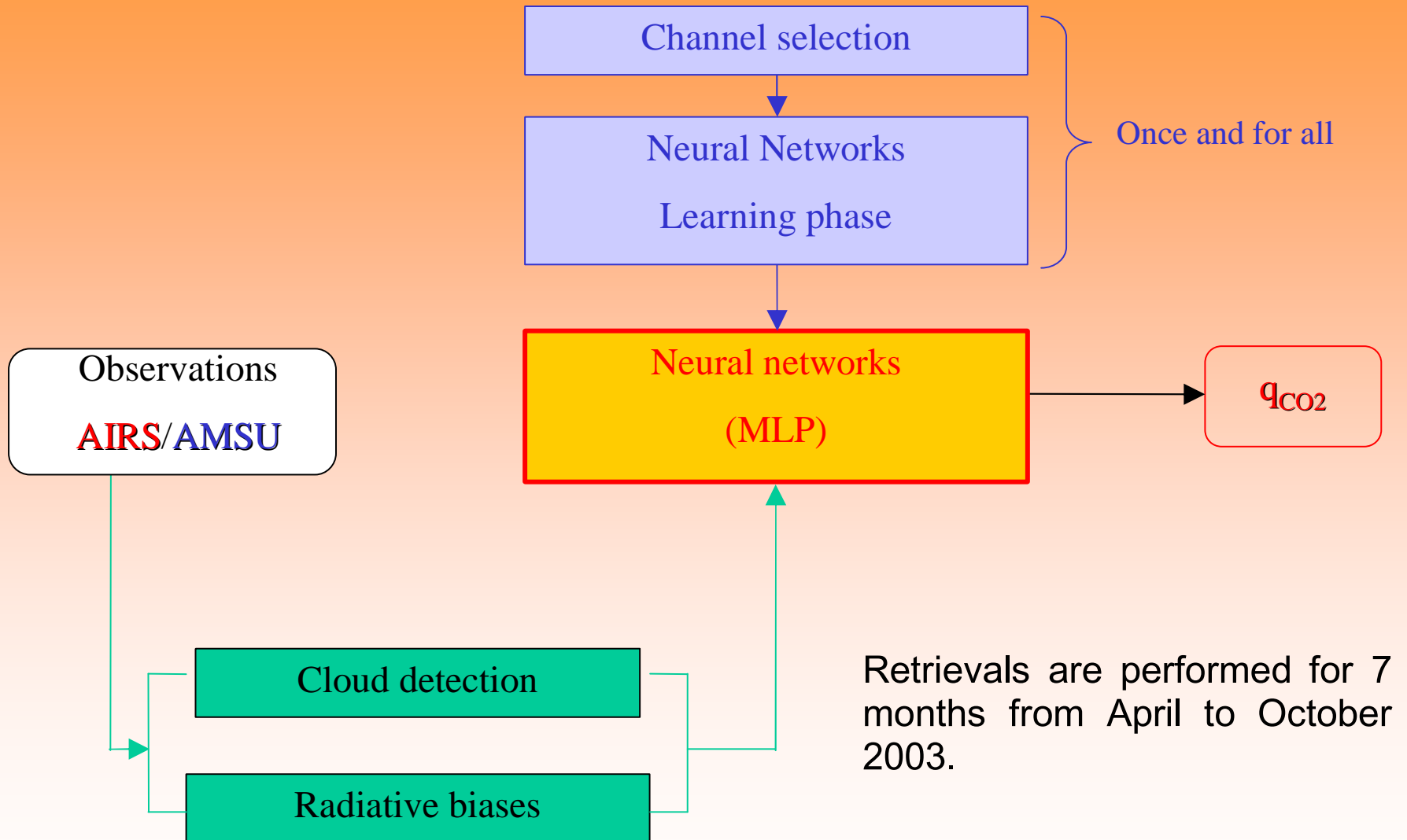


Purpose : approximation of complex function

given a set of input and outputs $(\mathbf{X}^i, \mathbf{Y}^i)$, the learning dataset

Training of the network : determination of the weights using a gradient descent algorithm called «backpropagation» (Rumelhart)

Retrieval scheme



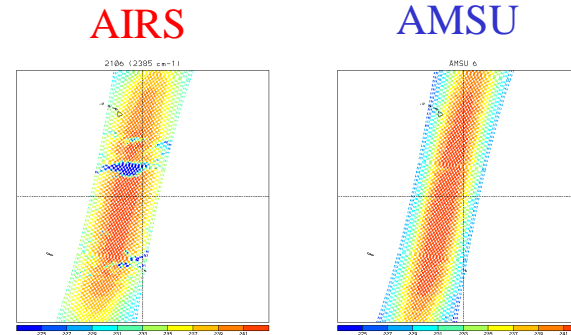
Description of the method

Looking for clear sky

Three kind of tests are used : $T_B^1 - T_B^2 < \xi$

$$8 T_B(\text{AIRS}) - T_B(\text{AMSU})$$

Sensitive to clouds **Insensitive to clouds**



$$5 T_B(\text{AIRS}) - T_B^{\text{reg}}$$

Regressions from $T_B(\text{AMSU})$

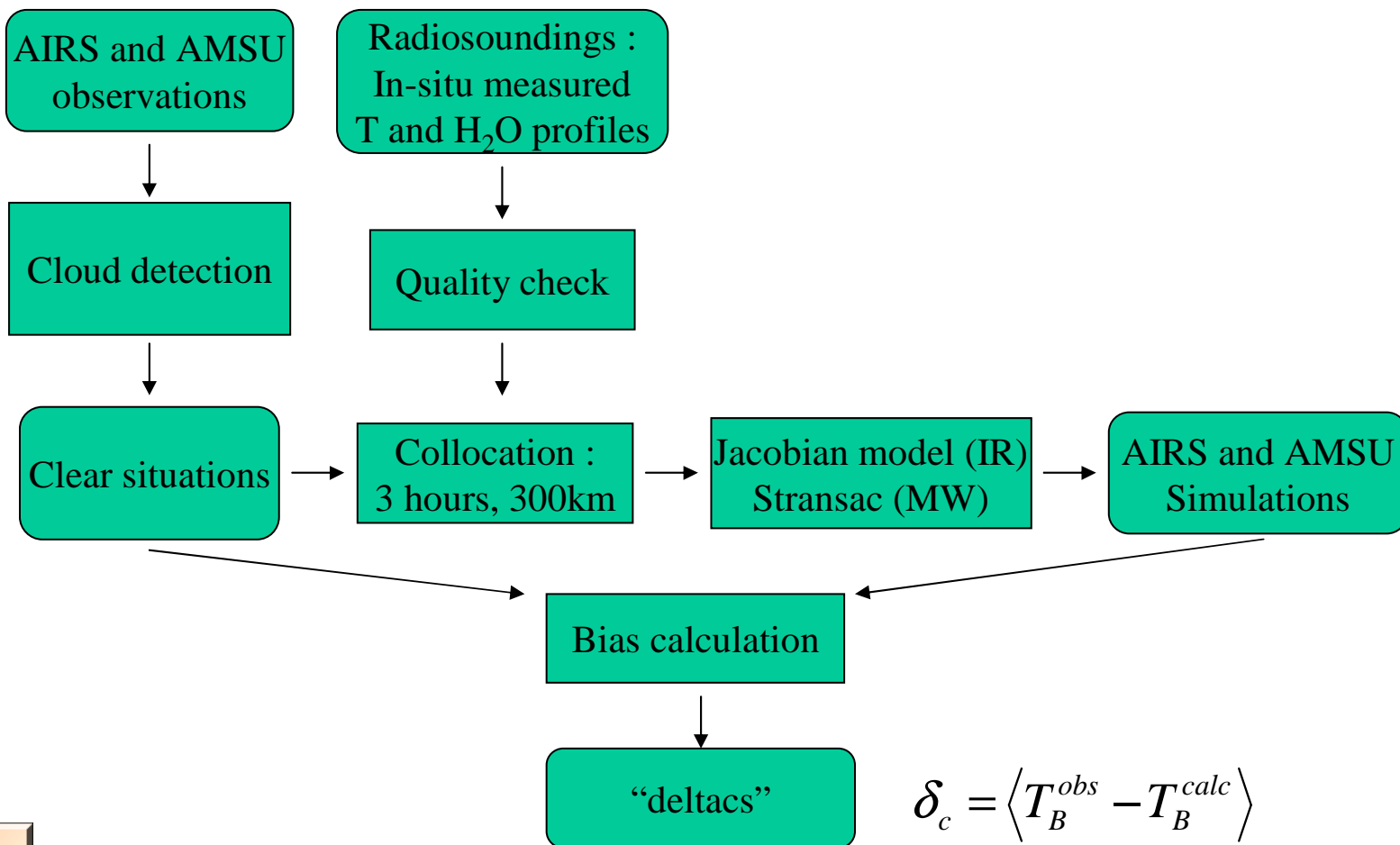
$$2 T_B(\text{AIRS}) - T_B(\text{AIRS})$$

Windows channels

Si $T_B^1 - T_B^2 < \xi$, then clear sky
else cloudy

These clear sky tests have been successfully validated against MODIS cloud detection for $P \leq 750$ hPa

Before applying the neural networks to observed AIRS and AMSU radiances it is necessary to correct for possible biases linked to calibration and radiative transfer error



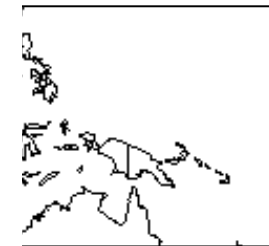
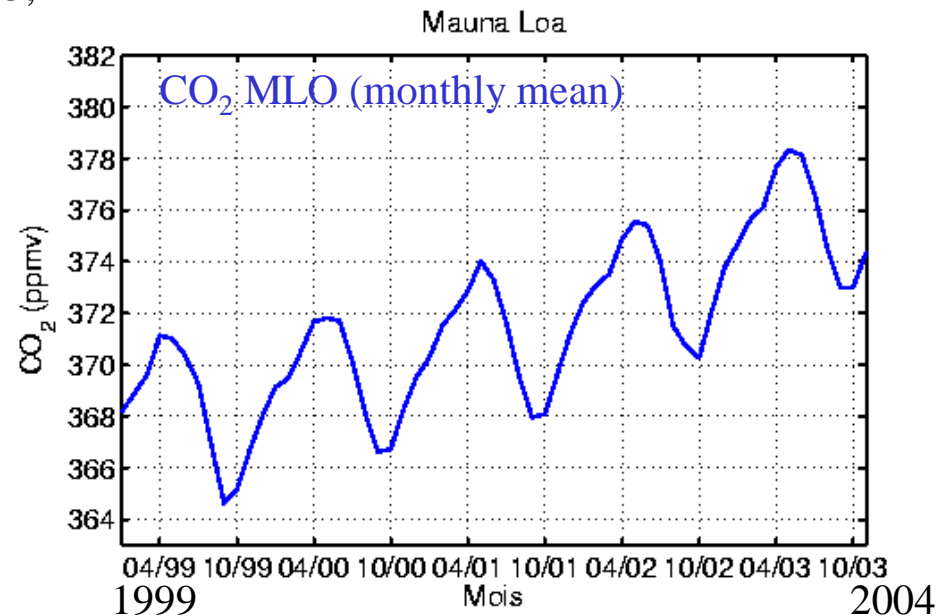
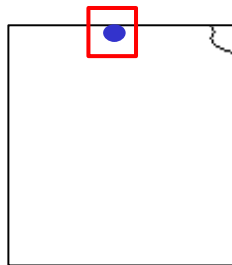
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Comparison with in situ observations made at **the surface**

Mauna Loa (Hawaii)
Daily measurements of
CO₂ since 1958
at an altitude of 3,4 km

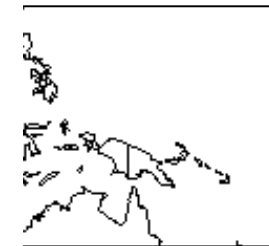
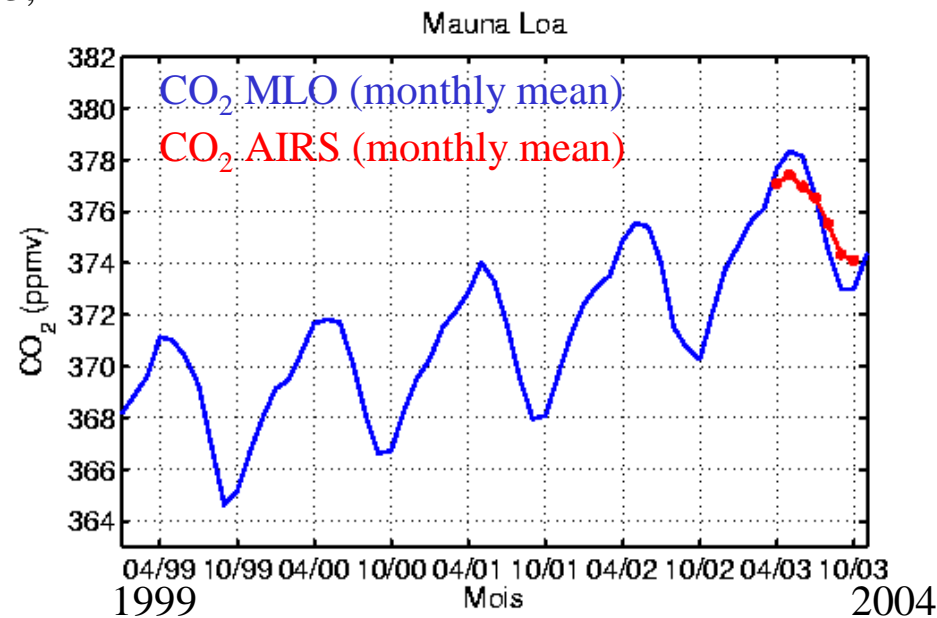
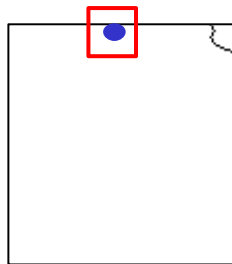
AIRS **retrievals** are averaged on a monthly basis over a 5°×5° box centered on MLO.



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Daily measurements of
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at an altitude of 3,4 km

AIRS **retrievals** are averaged on a monthly basis over a 5°×5° box centered on MLO.



Lower amplitude (3,4 km □ 5-15 km) but good agreement between both sets.

Study of the results

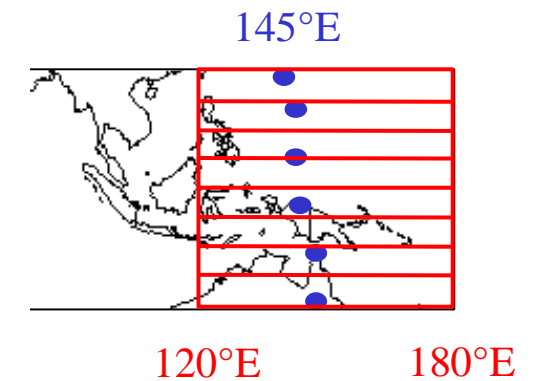
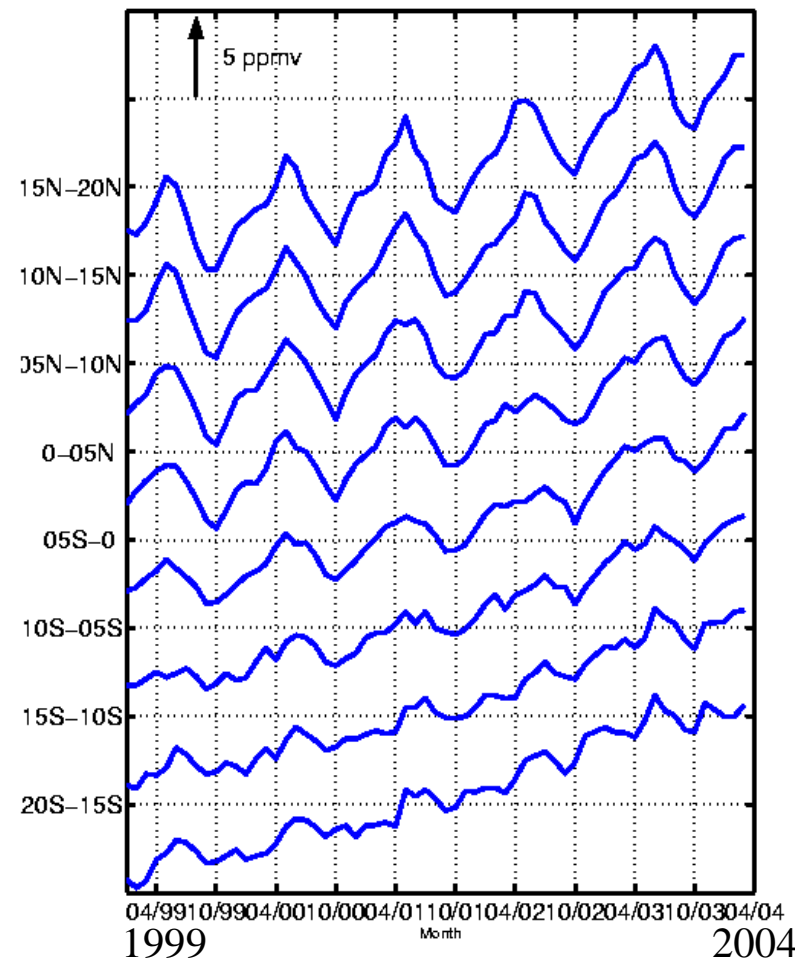
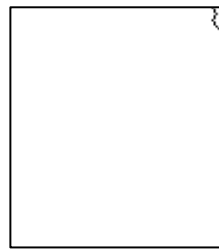
Seasonal variations

Comparison with aircraft measurements :

Since 1991, JAL aircrafts have been equipped to measured CO₂.

Altitude : 8-10 km (inside the zone 5-15 km seen by AIRS/AMSU).

One to two measurements per month.



*Average on 8
latitudinal bands
from 20S to 20N*

[Matsueda et al. 2004]



Study of the results

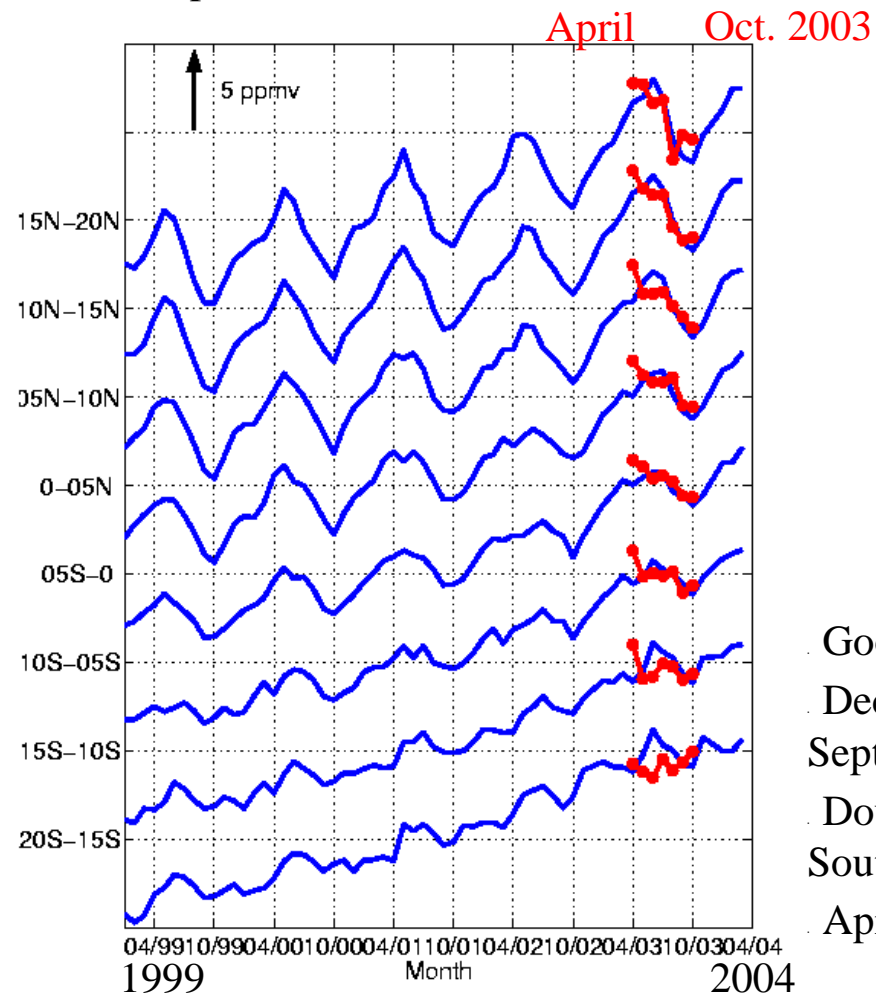
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One to two measurements per month.



Average over 8 latitudinal bands from 20S to 20N

[Matsueda et al. 2004]



- Good agreement.
- Decrease from July to September.
- Double seasonal cycle in the South.
- April ?

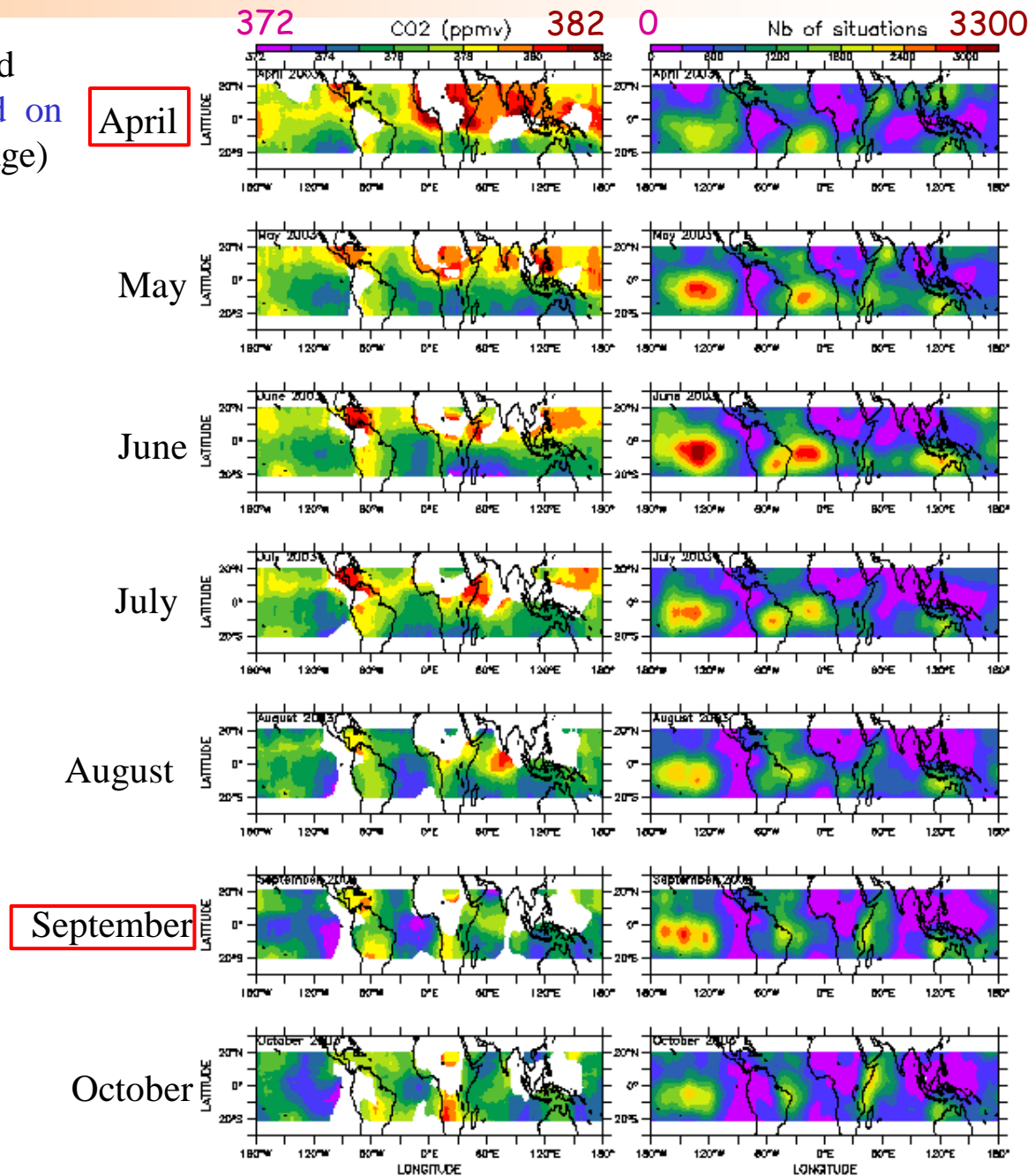


Study of the results

The retrievals are now averaged
-over $15^\circ \times 15^\circ$ boxes centered on
the $1^\circ \times 1^\circ$ boxes (moving average)
-on a monthly basis
-night time
-from April to October 2003.

Study of potential
interferences
Two « test » months

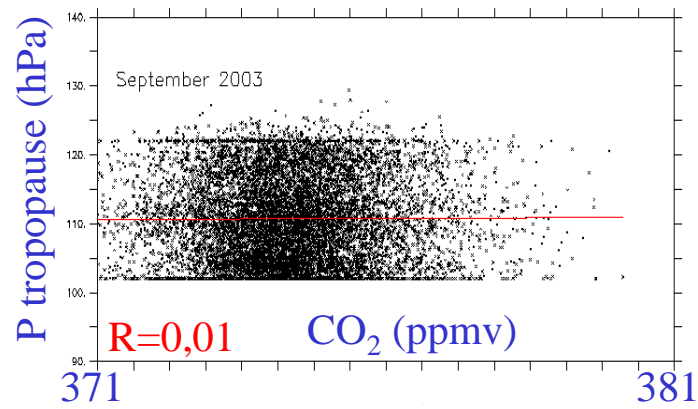
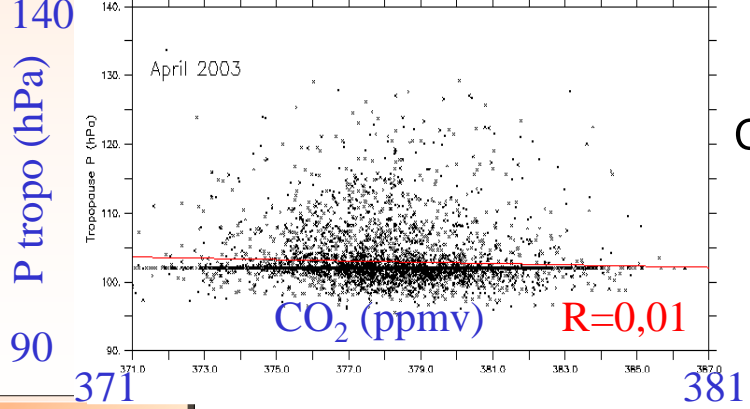
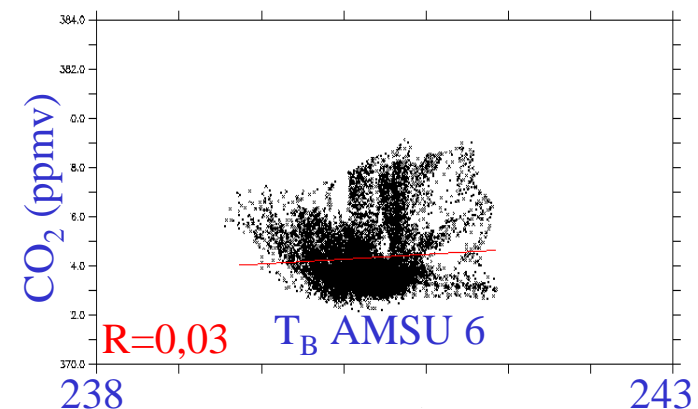
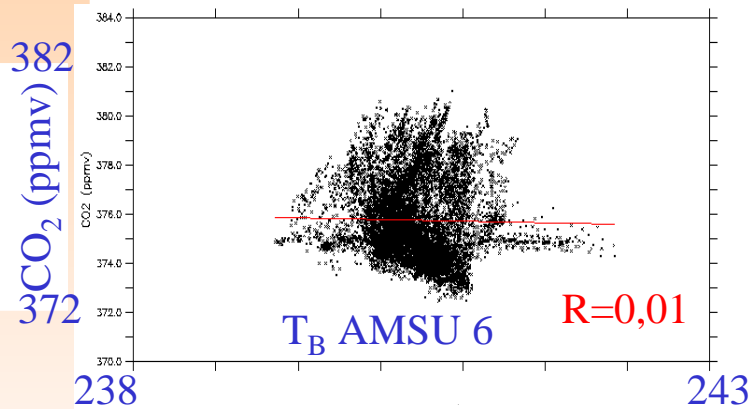
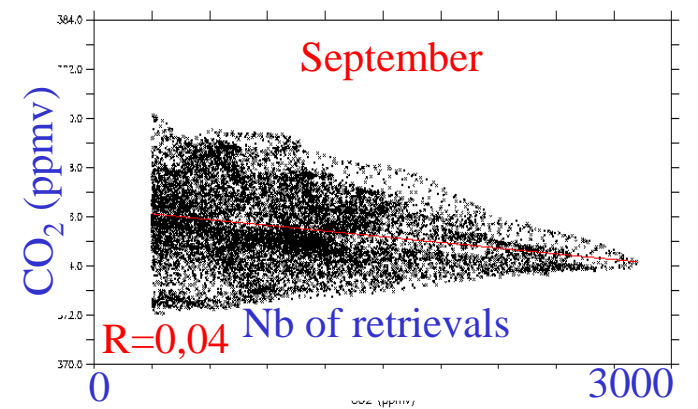
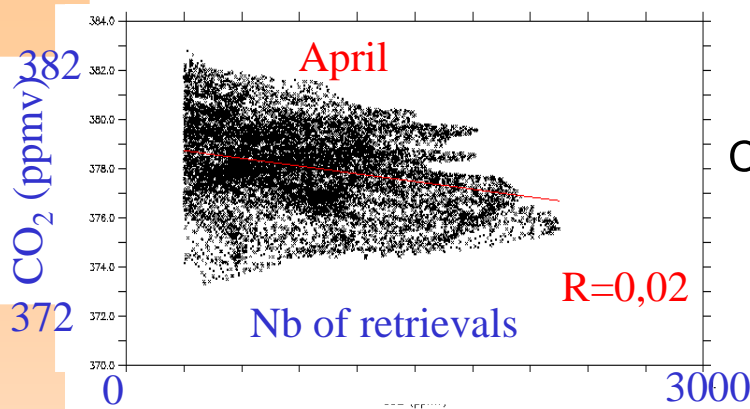
Geographical distributions



Study of the results

Geographical distributions

Study of the correlations



CO_2 /nb of retrievals per box

CO_2 /temperature

CO_2 /tropopause height

➔ The NN have successfully decorrelated T and CO_2 .

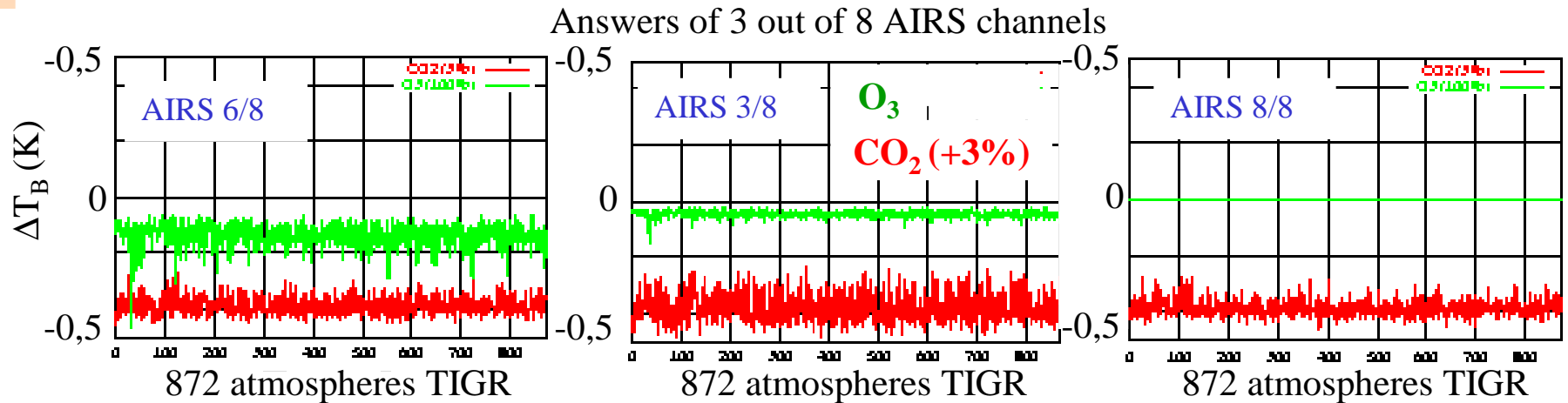


Sensitivity of neural networks :

The 8 AIRS channels have been selected for their weak sensitivity to interferences.

However, they are still sensitive to other signals (eg: ozone). Thus, we must verify the **impact of an ozone perturbation on CO₂ retrievals**.

Study: on a representative set of atmospheres, we make a perturbation of O₃ of **100%** between **0 - 16 km**.



The T_B are presented to the NN.

➡ The output error obtained is **0,13 ppmv** (mean) and **0,36 ppmv** (std).

This weak impact is due to:

- the **low sensitivity** to ozone.
- the **distinct behaviour**: CO₂ signal is constant / ozone signal varies.

Study of the geographical variations :

The validation of CO₂ geographical distribution is hard due to the lack of information on this gas.

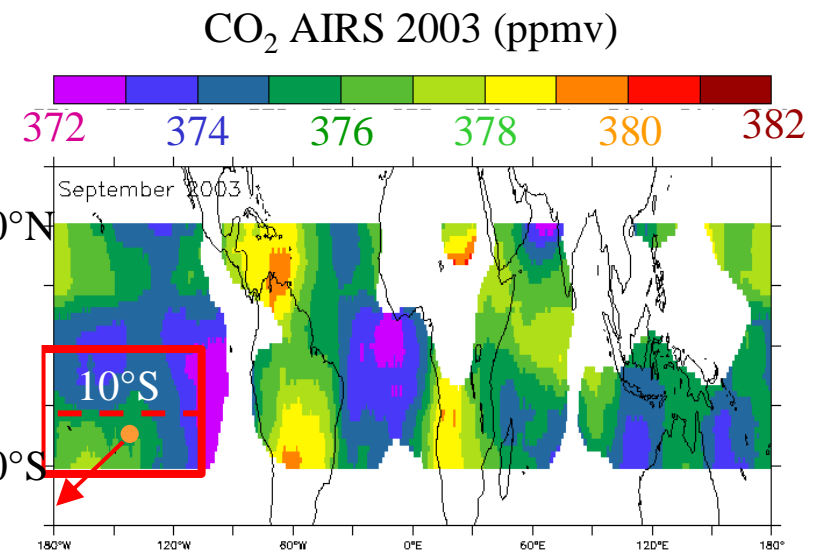
A few aircraft campaigns, always limited in both time (a few months) and space, have measured trace gases in the troposphere. Unfortunately, CO₂ was not systematically studied (as opposed to CO).

Example of PEM-T [Vay et al. 1999] :

110°W-170°W ; September 1996.

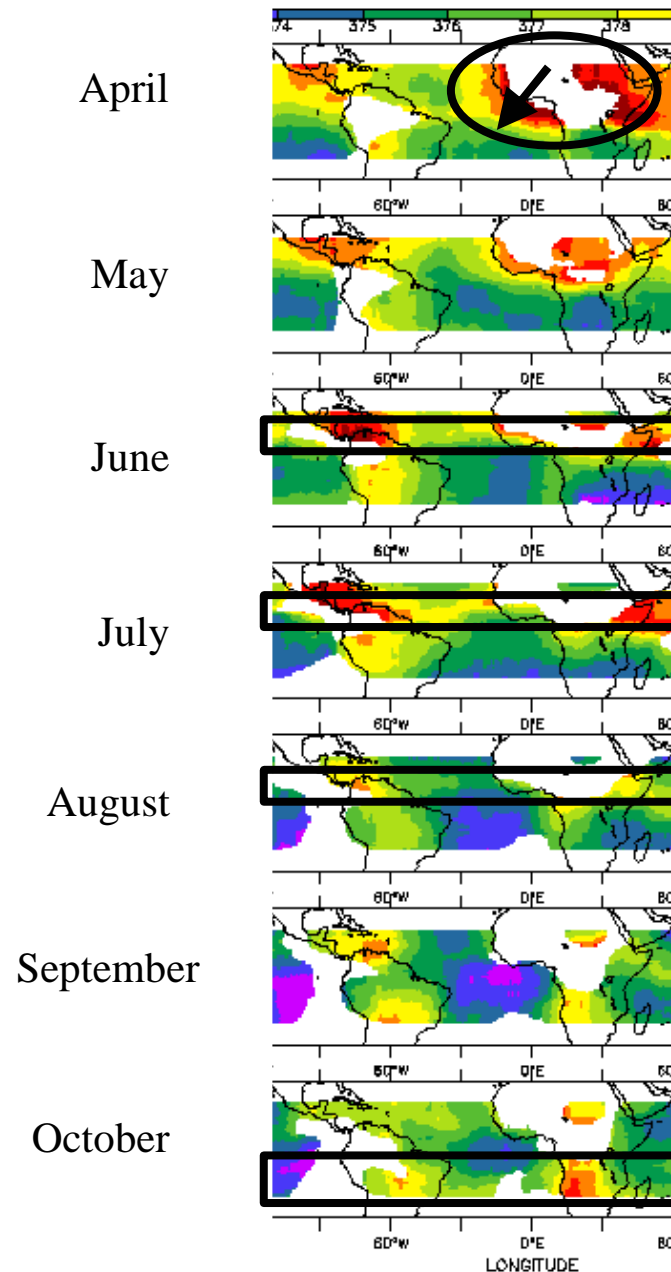
Between 6 and 12 km, the highest values of CO₂ were observed in the South, below 10°S, from Tahiti to New-Zealand.

But no decrease in the East of the Pacific...



Study of the results

Geographical distributions



Biomass burnings

Emissions of CO₂, CO, O₃, aerosols, ...

Mainly in dry tropical regions.

→ **seasonality** linked to dry seasons in both hemisphere:

Dec.-Fev. : North.

June-Sept. : South.

CO₂ AIRS (ppmv)

In April : central Africa [*Barbosa et al. 1999*] + expulsion in the « Golfe de Guinée » [*Baudet et al. 1990*]

Summer: [0;10°N].

In October [*Bremer et al. 2004*]

South Africa and America.

plum between both continents.

expulsion forward the Réunion Island

Qualitative agreement with AATSR fire counts and CO MOPITT measurements

Study of the results

Comparison with TOVS :

NOAA10 : July 1987-June 1991

Comparison with April-May 1990 and June-Oct. 1989 (weak El Nino)

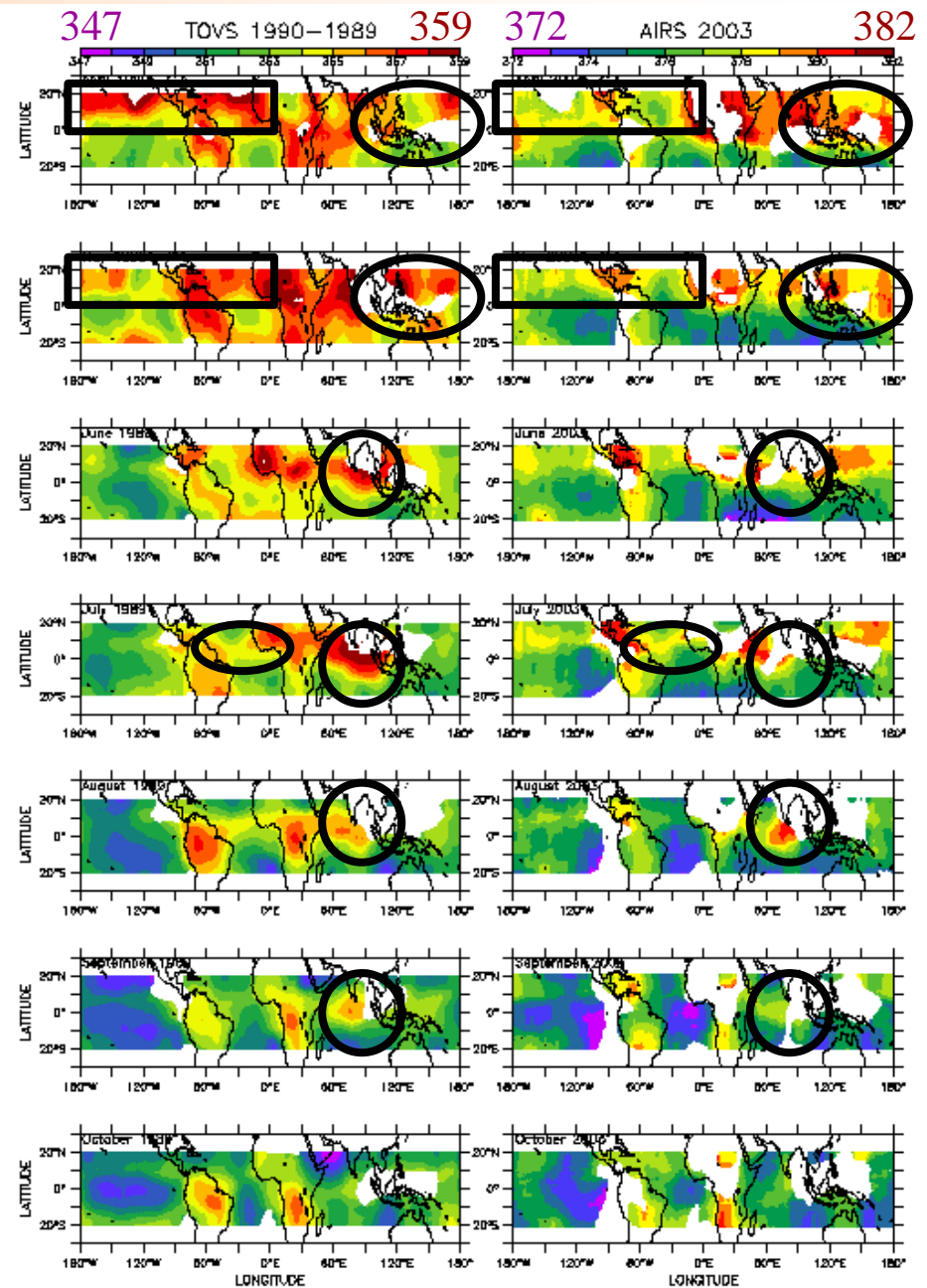
Given the interannual variations, both structures are similar:

- . Pacific.
- . Indian Ocean.
- . Atlantic ocean.
- . Biomass burnings.

Some **differences** :

- § North in April and May (O_3 ?).
- § Dynamic.

Geographical distributions



Study of the results

Comparison with transport model outputs (TM3 and LMDz in the framework of the COCO project) :

[Y. Tiwari, MPI, private com.].

model inputs:

· Sources: 2002.

· Winds: ECMWF 2003.

· AIRS weighting function is applied to the outputs that are averaged following the same method as for AIRS retrievals.

➔ The models are zonal with very low longitudinal variations.

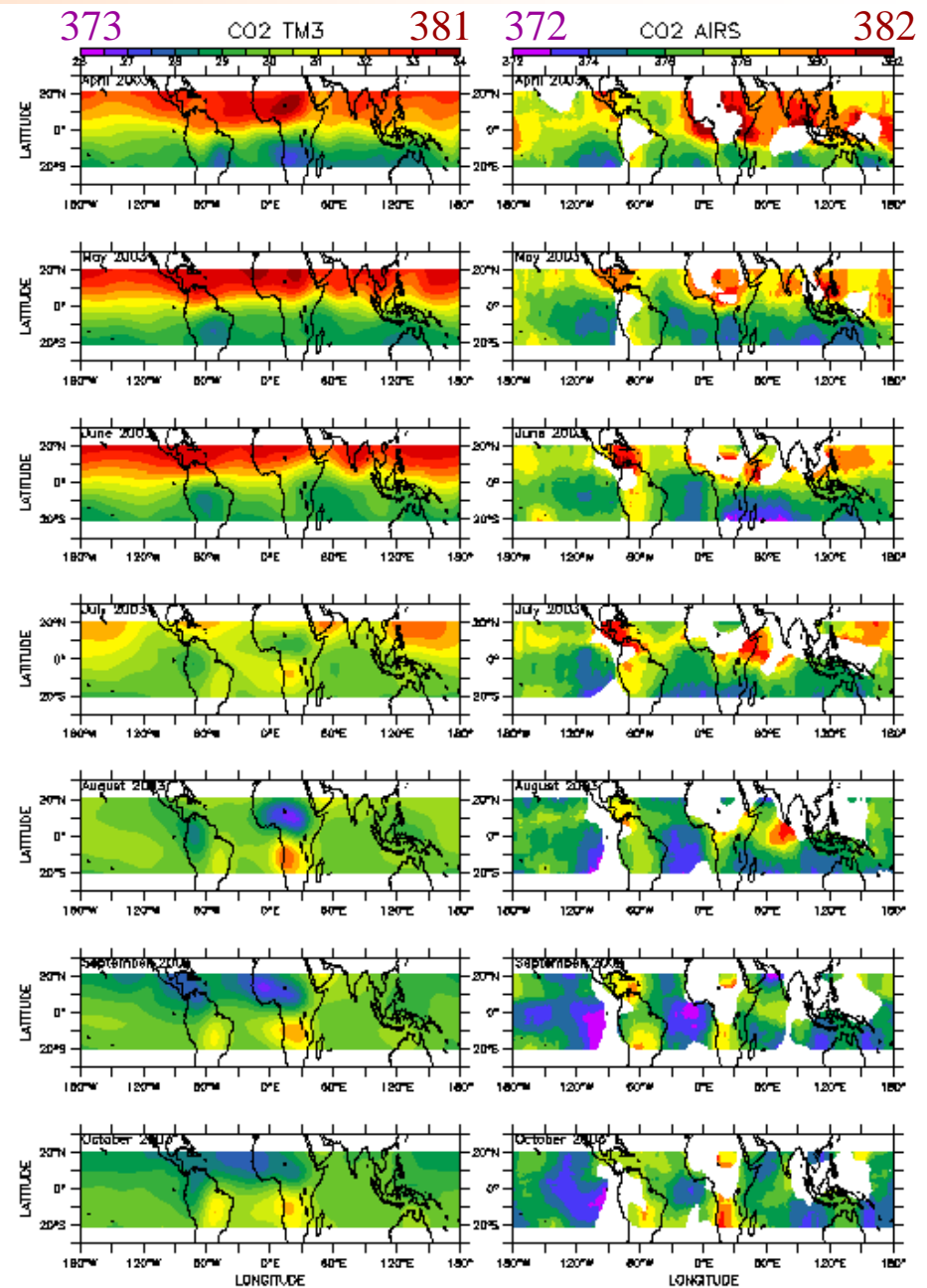
· Lower dynamic.

· Same fire locations.

· Origin of these differences ?

➔ Comparison with aircraft measurements (LMD/LSCE).

Geographical distributions



PRESENTATION OUTLINE

- Why is it interesting to measure CO₂ from space ?
- Which instruments are available for this purpose ?
- Presentation of the AIRS and AMSU instruments
- Radiative transfer, principles of atmospheric sounding
- Description of the retrieval method
- First results
- Conclusion, perspectives**

Conclusion and perspectives

- . Realisation of an AIRS/AMSU **archive**.
- . Channel selection:
 - OSP method for CO₂, CH₄, N₂O and CO.
 - à Extension to other instruments : **IASI**.
- . **Clear sky** detection.
- . Tropospheric CO₂ retrieval:
 - . Extension of the TOVS NN method.
 - . Tropospheric CO₂ retrieval (**5-15 km**), in the tropics [**20°S;20°N**], **night time**, from **April to October 2003**.
 - . Good agreement with *in situ* measurements.
 - . **Monthly** distribution at a resolution of **15°×15°**, with a precision of **2,5 ppmv**.
 - . Good agreement with **TOVS** retrievals.
- . **Transport models**.

CO₂ campaigns are needed to validate the retrievals !

Conclusion et perspectives

- . Extension of the method : tropospheric CO₂ in the tropics:
 - à Better computation of **radiative biases**.
 - à **2004**.
 - à Comparaison between retrievals / **aircraft campaigns** / transport models.
- . Extension of the method :
 - à High-latitude regions ?
 - à **stratospheric** CO₂ ?
- . Other trace gases and instruments:
 - à **CH₄ (initiated), CO, N₂O**.
 - à **IASI**